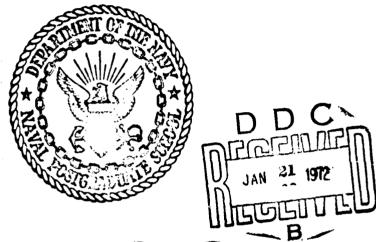
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# United States Naval Postgraduate School



# THESIS

AN ALGORITHM FOR THE SOLUTION OF CONCAVE-CONVLX GAMES

by

Lee Fredric Gunn

and

Peter Tocha

Thesis Advisor:

J. M. Danskin, Jr.

September 1971

Approved for public release; distribution unlimited.

# An Algorithm for the Solution of Concave-Convex Games

by

Lee Fredric Gunn Lieutenant, United States Navy B.A., University of California, Los Angeles, 1965

and

Peter Tocha Kapitänleutnant, German Navy

Submitted in partial fulfillment of the requirements for the degree of

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Authors	Tie Fredire Im
·	ich Works
Approved by	: John M. Danski Thesis Advisor
	Chairman, Department of Operations Research and Administrative Sciences
	Academic Dean

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#### ABSTRACT

A master's thesis which discusses the solution of concave-convex games. An algorithm is developed, a computer program written and applied to an anti-submarine warfare force allocation problem as an illustration. Techniques for handling concave-convex problems in high dimensions are included.

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#### I. INTRODUCTION

#### A. A GAME THEORY APPROACH TO RESOURCE ALLOCATIONS

Problems in the allocation of resources can be divided into two descriptive categories: Single-agent problems and adversary problems. Single-agent problems have only one participant optimizing without intelligent opposition. In the solution of adversary problems, opponents work at cross purposes. Each choice of an allocation of resources by one participant must be made in light of those of his opponent(s). Of course, games are adversary problems.

The great interest in game theory as a technique of modelling which followed von Neumann's statement of the fundamental concepts in 1927 [18] continues today. The fascination of the game as a model for conflicts of almost any sort is enhanced by the fact that the solution to a game is entirely independent of assumptions regarding the actual behavior of the antagonist(s).

Matrix games and differential games are extensively treated in the literature; some references are noted here.

Matrix games or games over the square are discussed in basic form by Williams [21] and a thorough study is done by Karlin [8]. For a first essay in the subject of differential games, see Isaacs [6]. Taylor [16,17] gives additional examples of the modelling of combat operations including search using differential games.

The development of the derivative game is due to

Danskin [4]. A very large class of concave-convex problems

yield to solution when the algorithm based on this game is applied. It is with the derivative game and the algorithm evolved from it that this paper is primarily concerned.

#### B. THE CONTENT OF THE PAPER, BY CHAPTER

Chapter II surveys some of the more important mathematical ideas necessary to the development of the algorithm for the solution of concave-convex games.

chapter III is concerned with the programming of an anti-submarine warfare force allocation example. The example serves to illustrate both the use of the algorithm and the theory on which it is founded. The problem is formulated and the basic computational steps toward the solution are enumerated. If any fears stem from the formidable appearance of the matrices used in the example, they hopefully will be dispelled by the description of the form for input in the programming notes. Technical matters regarding programming are considered in some detail.

Chapter IV draws together this presentation with some concluding remarks.

Chapter V contains suggestions for further study.

The Appendix consists of the programming flowchart.

The Computer Program Listing is included as well.

#### II. MATHEMATICAL CONCEPTS

#### A. GENERAL

The fundamental theorem of the theory of games in the form appropriate here is the following:

Suppose F(x,y) is a continuous function on  $X \times Y$ , where X and Y are compact and convex. Suppose that the set of points X(y) yielding the maximum to F for fixed Y is convex for each such Y, and that the set of points Y(x) yielding the minimum to Y for fixed Y is convex for each such Y.

Then there exist pure strategy solutions  $x^{\circ}$  and  $y^{\circ}$  satisfying

$$F(x^{\circ},y) \geq F(x^{\circ},y^{\circ}), \forall y \in Y$$
  
 $F(x,y^{\circ}) \leq F(x^{\circ},y^{\circ}), \forall x \in X.$  (1)

A complete proof of the theorem in this form can be found in [7]. Assuming that the conditions for the existence of a solution satisfying (1) are met, the problem can be stated in the form

which is equivalent to

$$\max_{x} \phi(x)$$

$$\phi(x) \equiv \min_{v} F(x,y).$$

The theorem applies to two-person zero-sum games. Thus,

Max Min 
$$F(x,y) = Min Max F(x,y)$$
.  
x y x

One important difficulty arises from the fact that, although F may be smooth,  $\phi(x)$  is not in general differentiable in the ordinary sense. Danskin, in [3], has shown that under general conditions on X and Y, there exists a directional derivative in every direction. It is this fact that has provided the key to the solution of problems of the type described.

#### B. THE ALGORITHM FOR THE SOLUTION OF CONCAVE-CONVEX GAMES

The algorithm to solve games concave in the maximizing player and convex in the minimizing player is developed and presented in great detail in [4]. The following gives a brief survey of those results which are most important for the design of the algorithm; to fill the apparent gaps, a thorough reading of [4] remains necessary.

#### 1. The Derivative Game

Suppose  $x^{\circ} \in X$ . Associate with  $x^{\circ}$  a non-empty set of admissible directions  $\gamma$ ,  $\Gamma(x^{\circ})$ .  $\hat{W}$  is defined as the convex hull (e.g., see [19]) of the set of points

$$W(y) = \{F_{x_1}(x^{\circ}, y), \cdots, F_{y_k}(x^{\circ}, y)\},\$$

where  $y \in Y(x^{\circ})$ .

The derivative game then is

$$H(\gamma, \hat{w}) = \gamma \cdot \hat{w}$$

defined over  $\Gamma(x^{\circ})$  x  $\hat{W}$ . The maximizing player maximizes H by choice of  $\gamma \in \Gamma(x^{\circ})$ , the minimizing player minimizes H by choice of  $\hat{W} \in \hat{W}$ .

#### THEOREM I

A necessary and sufficient condition for the existence of a direction of increase for  $\phi(x)$  is that the value of the derivative game defined by H be positive at  $x^{\circ}$ . The  $\gamma^{\circ}$  which yields the value of the derivative game is a pure strategy.

If the value is positive one can find and use this direction.

If the value is non-positive, a direction of increase does not exist, i.e., the solution has been reached.

The application of the derivative game in practice is greatly complicated by the necessity for approximations.

#### 2. The Lemma of the Alternative

The Lemma takes into exact account the approximations involved in the application of the derivative game. It states that a certain process (to be explained below) must either yield a sufficient increase to  $\phi(x)$  at a point  $x^{\circ}$  or determine that the point  $x^{\circ}$  is nearly optimal. Before the lemma can be formulated in mathematical terms, some further difficulties and the tools with which to overcome them have to be outlined.

a. The Brown-Robinson Iterative Process in the "Auxiliary Game"

The Brown-Robinson (B-R) process employs the following idea: Let G be the pay-off function. At stage N=0 both players choose arbitrary strategies  $x^{\circ}$  and  $y^{\circ}$ . At stage N=1 the maximizer chooses  $x^{1}$  such that G is maximized against  $y^{\circ}$ ; then the minimizer chooses  $y^{1}$  to minimize G

against  $x^1$ , and so forth. At stage N the maximizer chooses  $x^N$  as if the minimizer's strategy were an evenly weighted mixture of strategies  $y^{\circ}$ ,  $\cdots$ ,  $y^{N-1}$ ; the minimizer chooses  $y^N$  as if the maximizer's strategy were an evenly weighted mixture of strategies  $x^{\circ}$ ,  $\cdots$ ,  $x^N$ .

that

For matrix games, Julia Robinson [12] proved

$$\lim_{N\to\infty} \sup \left[ \frac{1}{N} \sum_{n=0}^{N-1} G(x,y^n) - \frac{1}{N} \sum_{n=0}^{N} G(x^n,y) \right] = 0.$$

Danskin [1] has generalized the proof to hold for two-person zero-sum games with continuous pay-off defined over X x Y, X and Y arbitrary compact spaces. It should be noted here that the B-R process is very slow in convergence when applied directly to finding an approximation to the value of the game defined by (1). However, it is not applied to the basic game in this algorithm but rather to an "auxiliary game" for which an accurate solution is not required.

The derivative game mentioned above cannot be solved directly because the set  $Y(x^{\circ})$  is not known. All one has is a single element  $y \in Y$  which approximately minimizes  $F(x^{\circ},y)$ . The place of the derivative game, therefore, is taken by the "auxiliary game" employing a modified version of the B-R process described below. This process makes it possible to keep track of the approximations involved and their consequences. The "auxiliary game" is defined as follows:

For any  $\varepsilon \ge 0$ , denote by  $Y_{\varepsilon}(x)$  the set of  $y \in Y$  such that  $F(x,y) = \phi(x) + \varepsilon$ . Let  $Y_{\varepsilon}(\Xi) \equiv \bigcup_{x \in \Xi} Y_{\varepsilon}(x)$ ,  $\gamma \in \Gamma(x^{\circ})$ ,  $y \in Y(\Xi)$ .

Then  $H(\gamma,y) \equiv \frac{F(x^\circ + d_0\gamma,y) - \phi(x^\circ)}{d_0}$ , for  $d_0 > 0$ , a minimum step size, is a game over  $\Gamma(x^\circ) \times Y_{\varepsilon}(\Xi)$  with  $\gamma$  the maximizing and  $\gamma$  the minimizing player. This game has optimal mixed strategies for both players. Applying the idea of approximate optimization to the convergence proof in [1] leads to

THEOREM II

Let  $\gamma^N$  be chosen such that  $\frac{1}{N} \sum_{n=0}^{N-1} h(\gamma, y^n)$  is maximized to accuracy  $\zeta$ , and  $y^N$  be chosen such that  $\frac{1}{N} \sum_{n=0}^{N} H(\gamma^n, y)$  is minimized to accuracy  $\eta$ .

Then 
$$\limsup_{N\to\infty}\left[\frac{1}{N}\sum_{n=0}^{N-1}H(\gamma,y^n)-\frac{1}{N}\sum_{n=0}^{N}H(\gamma^n,y)\right]\leq 2(\zeta+\eta).$$
 This holds for continuous H.

Let  $\theta$  be the maximum oscillation of  $\nabla F(x,y)$  over a distance  $d_0$ . Then

$$\frac{F(x^{\circ}+d_{o} \gamma^{N},y^{n}) - F(x^{\circ},y^{n})}{d_{o}} \geq \gamma^{N} F(x^{\circ},y^{n}) - \theta$$

The lemma of the alternative now can be formulated.

b. Statement of the Lemma Suppose  $0<\alpha<\beta$ ,  $y^{\circ}\epsilon Y_{\epsilon}(x^{\epsilon})$ .

Then the generalized B-R process will, at some stage N, determine that one of the two following statements is true:

1. The maximum over  $\Gamma(x^{\circ})$  of the directional derivative does not exceed  $\beta$ .

2. The point 
$$\overline{x}^N \equiv x^\circ + d_o \overline{\gamma}^N$$
, where  $\overline{\gamma}^{N} = \frac{1}{N} \sum_{n=1}^{N} \gamma^n$ ,

and the point  $y^N \epsilon Y_\epsilon(\overline{x}^N)$ , where  $y^N$  minimizes  $F(\overline{x}^N,y)$  to accuracy  $\epsilon$ , satisfy

$$\frac{F(\overline{x}^N, y^N) - F(x^{\circ}, y^{\circ})}{d_0} \geq \alpha - 5\theta - \frac{3}{d_0}.$$

#### 3. The Corollary of the Alternative

Suppose that F(x,y) is concave in x and convex in y. Then the modified B-R process applied at  $x^{\circ}$  will, at some stage N, determine that one of the two following statements is true:

1. The pair  $\overline{x} = x^{\circ}$ ,  $\overline{y} = \overline{y}^{N}$ , where  $\overline{y}^{N} = \frac{1}{N+1} \sum_{n=0}^{N} y^{n}$ ,

are approximate optimal strategies for the game defined by F.

2. The point  $\overline{x}^N \in X$  yields an increase to  $\phi(x)$  by at least a specified amount.

For details and proof see [4], pp. 36 ff.

Reference [4] continues with a detailed discussion of delicate problems which can only be listed here: The choice of the minimal step size  $d_0$ ; the problem of accessibility of a point x from a point  $x^o$ ; the problem of obstruction; the choice of  $\alpha$ ,  $\beta$ ,  $\epsilon$ , their interaction with each other, and the choice of  $\rho$  where  $\rho$  is the accuracy to which Max  $\phi(x)$  is to approximate the value of the game defined by

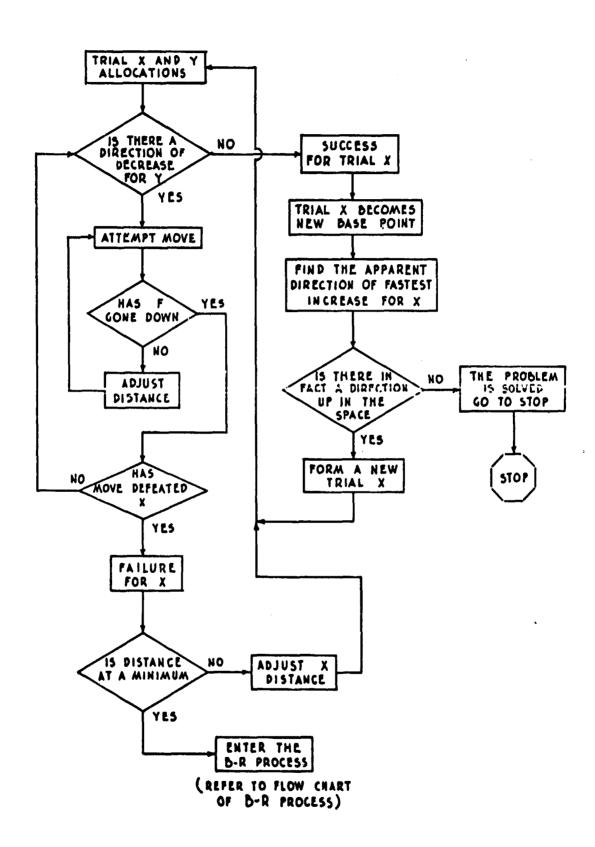
(1). It must be noted that the conditions derived for the selection of these parameters are sufficient.

#### 4. The Algorithm

The algorithm as a consequence of the foregoing mathematical considerations is presented in section 10 and 11 of [4] and will not be reproduced here in detail. A verbal description of its basic structure - depicted in Figure 1 -, however, may be useful:

The maximizing player, called Max, having arrived at a point xx, has a direction of maximal increase y, obtained either from the derivative game  $D_{\nu}\phi(xx)$  or from the B-R process in the auxiliary game, and a distance  $d \ge d_0$ . The minimizing player, called Min, is at a point yy. F(xx,yy)is known. Max makes a proposal to move to a point x = xx + dy. Of course, F(x,yy) > F(xx,yy). Min accepts Max's proposal and starts minimizing against x, looking for a direction of maximal decrease g. If there is none, yy is a minimum against x as well as against xx in which case Max will move to the point x. If there is a direction of decrease Min forms a point y = yy + Dg such that  $F(x,y) \leq F(x,yy)$ . A test is performed to determine whether Min has already "beaten" Max: if F(xx,yy) > F(x,y) Min stops the minimization process, and Max discards his proposal x because moving to x will not increase  $\phi(x)$ . Max halves the distance d and, with the same  $\gamma$ , forms a new trial point x. If F(xx,yy) < F(x,y)Min continues to minimize until either F(xx,yy) > F(x,y) or Min can no longer find a direction of decrease. If now

Figure 1. Flowchart of Algorithm.

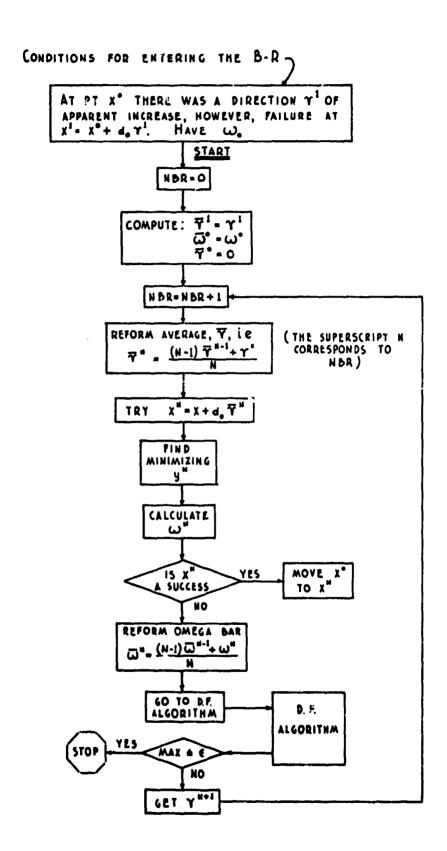


F(xx,yy) < F(x,y), indicating that Min, even after a complete minimization, was not able to "beat" Max, Max moves to the proposed point x realizing a gain for  $\phi(x)$ . Max then looks for a new direction of increase. The process terminates when such a direction does not exist.

The situation that leads into the Brown-Robinson process is the following one: The proposed points  $x = xx+d\gamma$  have been "beaten" by Min until d gets cut down to  $d_0$ , in spite of the fact that  $\gamma$ , obtained from the derivative game, is an apparently good direction. If the trial point  $x = xx + d_0\gamma$  does not result in a move for Max, the B-R process, Figure 2, is used.

Denote the present  $\gamma$  - the one that so far has lead to a failure for Max by  $\overline{\gamma}^1$ , and the associated  $\nabla F_{\chi}$  by  $\overline{\omega}^{\circ}$ . Minimize F completely against  $x = xx + d_0 \gamma$ . The resulting y then leads to a new  $\nabla F_{\chi}$  which is averaged with the previous  $\overline{\omega}^{\circ}$ , giving  $\overline{\omega}^1$ . Suppose that  $\overline{\omega}^1$  as input to the derivative game  $D_{\gamma}\phi(x)$  produces a new  $\gamma^{\circ}$  such that the value of the derivative game is positive as required. (If such a  $\gamma^{\circ}$  does not exist the problem is solved). This  $\gamma$ , averaged with  $\overline{\gamma}^1$ , gives  $\overline{\gamma}^2$  which in turn creates a new trial point  $\overline{x}^2 = xx + d_0 \overline{\gamma}^2$ .  $\overline{x}^2$ , or  $\overline{x}^N$  in general, then is exposed to Min's reaction as described previously. Once Max finds a direction and an associated trial point that cannot be "beaten" by Min, Max moves and leaves the B-R routine. The y-strategies are also averaged and saved although their average is never used during the computation. In case the

Figure 2. The Brown-Robinson Process.



game defined by F(x,y) is terminated while in the B-R process, this average of the y-strategies represents the optimal solution for the minimizing player.

#### III. PROGRAMMING ASPECTS OF AN ILLUSTRATIVE EXAMPLE

#### A. FORMULATION OF THE PROBLEM

An algorithm for the solution of a wide class of concave-convex games over polyhedra has been presented in abbreviated form above. In this chapter that algorithm is applied to a particular game, an anti-submarine warfare force allocation problem.

For this problem, five indices are employed: h, i, j, k, and m. In a meaningful example, the maximum numbers corresponding to these indices might be, respectively: 5, 25, 10, 500, and 5. The indices have the following meanings:

- h: Sabmarine type
- i: Submarine mission
- j: Type of antisubmarine weapon (or vehicle)
- k: Place in which submarine and weapon encounter one another
- m: Stage of the submarine mission.

An additional index is used. 1(k) is the "kind of place."

A "kind of place" might be defined by a particular set of weapon employment parameters. These include the tactical and the natural environment. The natural environment consists of oceanographic and meteorological conditions. Examples of the tactical environment are destroyers in an ASW screen and patrol aircraft in barrier patrol. The "kind of place" in which an encounter occurs impacts on the outcome

of an encounter between submarine and weapon. A reasonable number of "kinds of places" in the present context might be 25.

A submarine mission is described by a matrix  $||E_{hijkm}||$ . This matrix has as its elements real numbers denoting the extent to which a submarine of type h at stage m of mission i is exposed to a weapon of type j at the kth place. The effects of these weapons and thus of the encounters are characterized by a "technical" matrix  $||C_{hjl(k)}||$  in the following meaning:  $\exp[-C_{hjl(k)}y_{jk}]$  is the probability that a submarine of type h survives one exposure to y units of weapons of type j at a "kind of place" l(k). These encounters are assumed to be mutually independent. Note that the probability of survival to the mth mission stage is conditioned on the completion of the previous stages. Suppose that there are  $y_{jk}$  units of force of type j at the kth place. Then the probability of a submarine's completing stage m of mission i is

$$\prod_{m' \leq m} \exp[-E_{hijkm'}, C_{hj\ell(k)}, y_{jk}],$$

which, due to independence of the events, equals  $\exp \left[-\theta_{\mbox{him}}\right]$ , where

$$\theta_{him} = \sum_{\substack{j \\ m' < m}} \sum_{k} E_{hijkm'} C_{hj\ell(k)} y_{jk}.$$

Now, by carrying out a premultiplication,

$$A_{hijkm} = E_{hijkm} C_{hjl(k)}$$

the exponent becomes

$$\theta_{\text{him}} = \sum_{\substack{j \\ m' < m}} \sum_{k} A_{\text{hijkm'}} y_{jk}.$$

In this example, the vast majority of the  $E_{\rm hijkm}$ , and therefore of the  $A_{\rm hijkm}$ , are zero. If 3000 non-zero  $A_{\rm hijkm}$  are allowed, each type of submarine can be employed on ten different missions and undergo up to 60 encounters with antisubmarine weapon systems.

#### 1. The Space X

Let  $x_{hi}$  be the proportion of submarines of type h assigned to the i<sup>th</sup> mission. Make  $X = ||x_{hi}||$  satisfy the conditions

$$\sum_{i} x_{hi} = 1, \text{ for every } h, x_{hi} \ge 0,$$

and

 $\alpha_{hi} \le x_{hi} \le \beta_{hi}$ , for every pair h,i,

where the sets  $\{\alpha_{hi}\}$ ,  $\{\beta_{hi}\}$  are supposed to satisfy

$$\sum_{i} \alpha_{hi} < 1 + \sum_{i} \beta_{hi} \text{ for every } h$$

and

$$0 \le \alpha_{hi} < \beta_{hi}$$
 for every pair h,i.

#### 2. The Space Y

Let  $y_{jk}$  be the proportion of antisubmarine forces of type j sent to the  $k^{th}$  place. Make Y =  $||y_{jk}||$  satisfy the conditions

$$\sum_{k} y_{jk} = 1, \text{ for every } j, y_{jk} \ge 0$$

and

$$a_{jk} \le y_{jk} \le b_{jk}$$
 for every pair j,k

where the sets  $\{a_{jk}\}$ ,  $\{b_{jk}\}$  are supposed to satisfy

$$\sum_{k} a_{jk} < 1, < \sum_{k} b_{jk}$$

and

$$0 \le a_{jk} < b_{jk}$$
 for every pair j,k.

#### 3. The Function F(x,y)

 $V_{\mbox{him}}$  is the value of accomplishing stage m of mission i for a submarine of type h. The character of F(x,y) can be examined.

Set

$$W_{him} = V_{him} \exp \left[-\theta_{him}\right]$$

where  $\theta_{him}$  is as before. Put

$$T_{hi} = \sum_{m} W_{him}$$
.

Then

$$F(x,y) = \sum_{h,i}^{m} x_{hi} T_{hi}.$$

This function is linear in x and exponential in y and is therefore a concave-convex game of the type treated in [4], defined over  $X \times Y$ . The quantity F(x,y) represents the total expected payoff to the submarine player. Re-expressing F(x,y) in its explicit form gives:

$$F(x,y) = \sum_{h} \sum_{i} x_{hi} \sum_{m} v_{him} \exp\left[-\sum_{j} \sum_{k} E_{hijkm} C_{hj\ell(k)} y_{jk}\right].$$

The remainder of this chapter gives details of the application of the algorithm to the game defined above.

The principal result is the flow-chart (Appendix). Since this flow chart is constructed around the algorithm from [4], it is helpful, though not essential, to have [4] available. The complete program listing is included following the Appendix. The program is written in FORTRAN IV and was run on the IBM 360/67 computer at the Naval Postgraduate School, Monterey, California.

#### B. BASIC COMPUTATIONS

# 1. Computation of 8 him

For fixed (h,i),  $\theta_{\mbox{\scriptsize him}}$  is non-decreasing in the mission stage m. This reflects the trivial fact that

P[submarine survives stage m]

< P[submarine survives stage m-1].

Equality holds when the "threat" due to the encounters at stage m is non-existent, i.e., when either no ASW-forces  $y_{jk}$  are present or their effectiveness against the submarine,  $C_{hj\ell(k)}$ , is zero. Hence  $\theta_{him}$ , for each pair (h,i), is accumulated over the mission stages as follows:

$$\theta_{\text{him}} = \theta_{\text{hi}(m-1)} + \sum_{j} \sum_{k} A_{\text{hijkm}} y_{jk}, \theta_{\text{hio}} = 0.$$

### 2. Partial Derivatives with Respect to $x_{hi}$

Because of the linearity of F in x the partials with respect to  $x_{hi}$ ,  $F_{x_{hi}}$ , are the coefficients of  $x_{hi}$  and do not explicitly contain x.  $V_{him} \exp[-\theta_{him}]$  can be represented as a matrix of dimension (n x m), where n is the number of pairs (h,i). Then

$$F_{x_{hi}} = \sum_{m} V_{him} \exp[-\theta_{him}]$$

is the sum of the elements in the (h,i) row of that matrix.

#### 3. The Value of F(x,y)

F(x,y) is obtained by pre-multiplying  $\boldsymbol{F}_{x_{\mbox{\scriptsize hi}}}$  by  $\boldsymbol{x}_{\mbox{\scriptsize hi}}$  and summing the products

$$F(x,y) = \sum_{hi} x_{hi} F_{x_{hi}}.$$

# 4. Partial Derivatives with Respect to $y_{jk}$

Because of the cumulative property of  $\theta_{him}$ , a change in  $y_{jk}$  during some mission stage m' will affect the following stages as well. For each pair (h,i), premultiply  $x_{hi}$  by the corresponding  $A_{hijkm'}$ , where m' is the mission stage in which the  $y_{jk}$  of interest occurs. Sum  $V_{him}$   $\exp[-\theta_{him}]$  over the mission stages for which m'<m, multiply the result with  $x_{hi}$   $A_{hijkm'}$  and sum the products over h and i:

$$-F_{y_{jk}} = \sum_{h} \sum_{i} x_{hi} A_{hijkm}, \sum_{m' < m} V_{him'} \exp[-\theta_{him'}].$$

### 5. Finding Directions of Increase (Decrease)

 $F_{xhi}$  and  $F_{yjk}$  are inputs to the derivative games for x and y. For x, the direction  $\gamma^{\circ}$  is sought such that  $D_{\gamma}\phi(x) = \nabla F_{x} \cdot \gamma$  is maximized; for y,  $g^{\circ}$  is sought such that  $D_{g}$  Max  $F(x,y) = \sum_{x} (x,y) = \sum_{x} ($ 

 $\nabla F_y \cdot g$  is minimized (equivalently,  $-\nabla F_y \cdot g$  is maximized). The side condition is that  $\gamma^\circ$  and  $g^\circ$  be unit vectors:

$$\sum_{i} \gamma_{hi} = \sum_{k} g_{jk} = 0, \sum_{i} \gamma_{hi}^{2} = \sum_{k} g_{jk}^{2} = 1; \forall h, \forall j.$$

A method of finding such directions - called THE DIRECTION

FINDING ALGORITHM - is derived from the Kuhn-Tucker conditions and the Schwartz Inequality. It is contained in [4] and has been applied to a vector - valued function by Zmuida in [22].

#### C. PROGRAMMING NOTES

The flow chart (Appendix) and the associated program may not be optimal with respect to machine time and memory space required, and may provide opportunities for improvement. For computer routines like this, intended to solve high-dimensional problems, a trade-off between time and space is generally apparent. The user, considering the particular facilities available to him, must decide on his optimal trade-off, and modify the program accordingly. The following discusses some of the techniques that have been implemented; it points out the major difficulties that have been encountered and the ways presently used to deal with these, and offers some remarks about the impact of the underlying mathematics on the use of the algorithm for realistic problems. The numbers referenced are statement numbers.

#### 1. Presentation of Input - The Mission Description

In a realistic application, most of the  $A_{hijkm}$  will be zero because the effectiveness  $C_{hj\ell(k)}$  contained in A will be zero. Example: suppose k denotes a place in the western Baltic and  $\ell(k)$  classifies this place as shallow with extremely poor sonar conditions; j denotes a nuclear killer-submarine,

h represents a conventional attack submarine. Then  $C_{hjl(k)}$  will be zero for all practical purposes.

The method of presenting the matrix E which avoids computing of and with A when C is zero, is one which is extremely easy for the user to understand and employ. He gives his description of a submarine mission by plotting it on a chart, marks off in order the places the submarine must go, and notes the forces it might meet at those places. He will give the exposure E required by the particular mission in terms of a standard which he will have set. He will mark off the points in the mission where the various stages of the mission will have been accomplished. Such a description might run as follows:

m = 0

m=1 (the first stage of the first mission is completed)

m=2

m=3

The above mission (mission 1 for submarines of type

1) has three stages and nine encounters, in four different

places. Then the listing starts for the next mission with

h=1, i=2, and continues until all missions for all types of

submarines have been described in this manner. Note that

this listing has already taken into account the classification

of the places k by l(k). This is done in such a way that for each encounter on this mission listing the associated  $C_{hjl(k)}$  is positive. In other words, a place k, and hence an encounter, will appear on the mission listing only if it seems possible that the opponent will allocate forces to that place and the corresponding effectiveness against the maximizer's submarine operating in that place is positive.

There are various possible ways of storing the information contained in the mission description in the machine. One way which is very economical in terms of storage space requirements is to read the list encounter by encounter, i.e., card by card, starting with an N=1. Then  $A(N) = E \cdot C_{hjl(k)}$  and an indicator array

$$P(N) = I \cdot J \cdot K \cdot M \cdot (h-1) + J \cdot K \cdot M \cdot (i-1) + K \cdot M \cdot (j-1) + M \cdot (k-1) + m + 1$$

contain the complete information. I, J, K, M denote the maximum values of the indices i, j, k, m. The reason for using (m+1) is that the correct m appears after the mth stage is completed. The disadvantage of this method is that during computations the individual indices must be recomputed from P(N):

$$h = 1 + \left[\frac{P(N)}{I \cdot J \cdot K \cdot M}\right]$$
 [\cdot] means "the largest integer in \cdot" 
$$\Delta = P(N) - I \cdot J \cdot K \cdot M(h-1)$$

$$i = 1 + \left[\frac{\Delta}{J \cdot K \cdot M}\right]$$

$$\Delta \Delta = \Delta - J \cdot K \cdot M \cdot (i-1)$$

$$j = 1 + \left[\frac{\Delta \Delta}{K \cdot M}\right]$$

$$\Delta \Delta \Delta = \Delta \Delta - K \cdot M(j-1)$$

$$k = 1 + \left[\frac{\Delta \Delta \Delta}{M}\right]$$

$$m = \Delta \Delta \Delta - M(k-1)$$

In the sample program contained in this paper, the indices in their original form are stored in vector arrays and are directly accessible throughout the computations.

## 2. The Contraction with Respect to $V_{\mbox{\scriptsize him}}$

This contraction takes into account the possibility that the stage m of a mission may have been noted, but that the associated  $V_{\rm him}$  may have been declared to be zero. Since it is useless to calculate anything involving a  $V_{\rm him}=0$ , the corresponding elements in the index arrays of the mission are eliminated. This is done prior to the execution of the game and may therefore be referred to as the basic contraction.

#### 3. Working in Subspaces

It can be expected that most of the  $x_{hi}$  and  $y_{jk}$  will be on their boundaries at any stage, including the approximate optimal solution. This suggests the idea of eliminating computations involving variables which have fixed values either temporarily or throughout the process.

To do this, one reduces the dimensions of the spaces, thus saving machine time. One can redefine the space so as to "freeze" the variables on the boundaries leaving the remainder free to move.

Where in the program should redefinition of the Y-space take place? The minimizer can hold the subspace fixed and continue to move in that subspace until an apparent minimum has been reached. At this point the allocation corresponding to this minimum has to be checked for optimality in the full space. This will require at least one iteration through the minimization routine in the full space. After a minimum valid in the full space has been obtained, the Y-space is reduced to a new subspace. An alternative approach is to redefine the space after each change in the Y-allocation, thus maintaining a continously changing subspace. The authors feel that the latter will enable the minimizing variable to stay in the subspace longer finding directions of decrease, before the need arises to employ the full space. This idea was implemented in the program.

The contractions for x (statement 1871) and y (125) eliminate computations involving elements that are on the lower boundaries. It must be noted that the contraction itself and the complications caused by its use take machine time. Worthwhile time savings in computation will not be realized until this technique is applied to relatively large scale problems.

INDX(N), N = 1,...,NNX, contains the indices of the  $x_{hi} > 0$ , INDY(N), N = 1,...,NNY, contains the indices of the  $y_{jk} > 0$ . NNX and NNY are the dimensions of the subspaces for X and Y. These index arrays are used to control which

variables are to be involved in the computations. The way this is done in practice can be seen in the program listing.

One remark concerning the DIRECTION FINDING ALGO-RITHMS, (400) and (1400), may be in order: these algorithms have to be applied row by row to the matrices  $||x_{hi}||$  and | | y ik | |. In subspaces, the number of elements belonging to a particular row varies. The outer do-loop runs over the number of rows. To find the numbers of elements per row (these numbers serve as the termination values of the inner do-loops) a test on the indices stored in INDX and INDY is conducted (402 ff), (1402 ff). The test value, NTEST, is the index of the last element in the rows of  $||x_{hi}||$  and  $||y_{jk}||$ , respectively. Much the test passes, all elements in the row at hand have been collected and the algorithm begins. Before the next row is picked, NSTART is incremented by the number of elements found in the previous row so that the search through INDX or INDY always starts in the correct position.

#### 4. Machine Accuracy Problems

The program calls for frequent testing of floating point numbers. Throughout the development of the program these tests have been sources of trouble. Testing for equality must be strictly avoided even after - as has been done here in various places - variables close to a fixed quantity have been reset to that quantity (e.g., (1050 ff) or (1060 ff)). Although the program specified double-precision, it took extensive experimentation to maintain

feasibility, i.e., satisfy the side conditions

$$\sum_{i} x_{hi} = \sum_{k} y_{jk} = 1$$

to at least the 13th decimal place.

Of critical importance is the accuracy in the computation of the direction matrices  $\gamma$  (GAX) and g (GAY). In the neighborhood of a maximum or minimum, the partials  $F_x$  and  $F_y$  are close to zero, as are the Lagrange multipliers (XMU and YMU), and the differences  $F_x$ -XMU,  $F_y$ -YMU (SD). In order to determine the value of the derivative game, the sum of the squares of these differences has to be formed, an operation that may very likely lead to erroneous results which, in turn, carry over into the computation of  $\gamma$  and g.

The countermeasure taken is to premultiply the SD when they are small by a large number, (505 ff), (1510 ff).

#### 5. Testing the Program

As the calling of subroutines is exceedingly time consuming, the present program does not use them. This made debugging tedious. The "standard" routine, i.e., the program employing the derivative games in the original form, was tested running a small scale example where ||x|| was  $(2 \times 2)$  and ||y|| was  $(2 \times 4)$ , making it possible to hand-check the computations.

The "auxiliary game" routine using the B-R process was debugged using the following objective function:

$$F(x,y) = 2x_1 \exp[-2y_1 - y_2] + 2x_2 \exp[-y_1 - 2y_2] + x_3 \exp[-y_1 - y_2 - y_3]$$
Subject to: 
$$\sum_{i} x_i = \sum_{k} y_k = 1$$

$$x_i, y_k \ge 0$$

with initial allocations x = (0,0,1), y=(0,1,0). For a discussion of this example in light of the algorithm see [4]. The reason that this can only be solved through the B-R routine lies in the fact that, against the initial x, any y represents an exact minimum, however, the value of the derivative game for x is positive, yielded by  $\gamma^{\circ} = (0, \sqrt{2}/2, -\sqrt{2}/2)$ .

Finally, an example with 100 encounters was rigged up where ||x|| was (4x4), ||y|| was (5x10). While this does not yet represent a problem in high-dimensional space, the authors are confident that this example provided a sufficiently severe test to demonstrate the validity of the program as written.

#### 6. General Comments

The following remarks are intended to facilitate the use and modification of the program.

#### a. Initial Allocation

The initial allocations are generated as corner points in the stationary part (99). It can be expected that, in the optimal solution, most of the variables will be on the boundaries. An initial point on the boundaries insures that the number of "absurd" allocations is minimal.

If one were to use an interior point as a starting solution, it possibly would involve large numbers of absurd allocations (e.g., a submarine in an aircraft barrier patrol). The machine would spend an enormous amount of time reducing such allocations to zero.

#### b. Distance Policy

The initial and re-set values for the distances are determined from the dimensions of the spaces; the user may employ his own rules. A compromise between re-set values too large causing "overshooting" and values to small causing "creeping" should be considered. In general, "creeping" is much costlier in terms of machine time. The policy for halving distances and its rationale is outlined in [4].

#### c. Upper and Lower Bounds

For simplicity, 0 and 1 have been used in the program. Specifying individual bounds  $\alpha_{hi}$ ,  $\beta_{hi}$  and  $a_{jk}$ ,  $b_{jk}$  does not introduce additional problems but increases the storage space required considerably (e.g., for y, two additional arrays of the same dimension as y).

#### d. Modifying the Objective Function

The algorithm as stated is valid for concaveconvex functions under quite general conditions. Though the present program has been designed to handle a particular linear-exponential function, it is quite flexible. The objective function mentioned in subsection 5 may serve to illustrate this point:

$$F(x,y) = 2x_1 \exp[-2y_1 - y_2] + 2x_2 \exp[-y_1 - 2y_2]$$

$$+ x_3 \exp[-y_1 - y_2 - y_3]$$

is produced by a very simple adjustment of the mission description:

The associated V-values are:  $V_{111} = 2.0$ 

 $V_{121} = 2.0$ 

 $V_{131} = 1.0.$ 

The associated  $C_{hjl(k)}$  are:  $C_{111} = C_{112} = C_{113} = 1.0$ 

# e. Assigning Values V<sub>him</sub>

The values (of completing stage m of mission i for submarine of type h) are relative measures. When assigning  $V_{\hbox{him}}$ , the user should consider that a submarine may have spent part of its weapons (resources) during stage m-1. This may reduce its operational capabilities for stage m, and the value for stage m should reflect this fact.

#### f. Choosing ρ (RHO)

The parameter  $\rho$ , mentioned in Chapter II, section B.2.b, has to be chosen by the user. It specifies

the accuracy to which Max  $\phi(x)$  is to approximate the value of the game F(x,y), V.  $\rho$  affects the y-minimization by controlling the accuracy,  $\varepsilon(d)$ , to which the derivative game  $D_g \underset{X}{\text{Max }} F(x,y) = -\nabla F_y \cdot g$  has to approximate its mathematical value. The y-minimization is the most time consuming portion of the process.

$$\varepsilon(d) = \frac{\rho \cdot d}{36 \cdot \delta}$$

where  $\delta$  is the diameter of the X-space. Considering the "worst" case, when  $d=d_0=\rho/36\cdot L$ , (L is the maximum oscillation of  $F_X$ ), it becomes apparent that

$$\varepsilon(d_o) = \frac{\rho^2}{36^2 \cdot \delta \cdot L}$$

is of order of magnitude  $\rho^2 \cdot 10^{-3}$ .

Recall that the conditions established for the validity of the algorithm are intended to guarantee that, at the approximate optimal solution,  $|\phi(x)-V| \le \rho$ . Test runs of the program seem to indicate that the accuracy actually obtained is much higher.

Although generally valid conclusions cannot be derived from this observation the user must be aware of this feature because he will pay heavily in terms of machine time when  $\rho$  is unreasonably small.

# IV. SUMMARY

The devlopment of the mathematical theory underlying the derivative game and the concave-convex game algorithm has only been sketched out in this paper. Here, that algorithm has been employed in the formation of a potentially useful example. With programming techniques designed to provide economical running in high dimensions, large-scale problems should be amenable to the application of the concave-convex game algorithm.

## V. SUGGESTIONS FOR FURTHER STUDY

#### A. MATHEMATICS

In Section III.C.6.e., the question of the proper choice of  $\rho$  was addressed. Recall that

$$| \max_{\mathbf{X}} \phi(\mathbf{X}) - \mathbf{V} | \leq \rho.$$

Even when the user has based his choice of a value for  $\rho$  on extensive experimentation with a program, he still will not know exactly how close Max  $\phi(x)$  is to the value of the game. The desirable state of affairs would be

$$| \max_{\mathbf{x}} \phi(\mathbf{x}) - \mathbf{V} | = \rho$$

This would require the formulation of necessary conditions on the functions  $\alpha$ ,  $\beta$  and  $\epsilon$ .

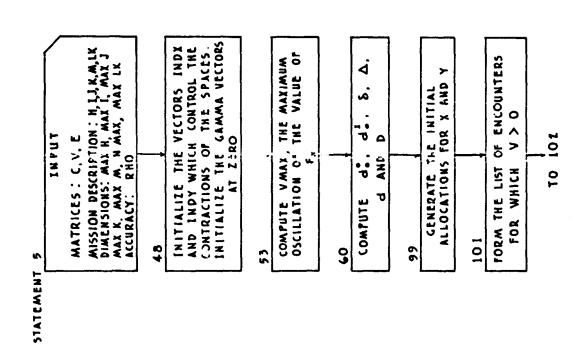
## B. PROGRAMMING

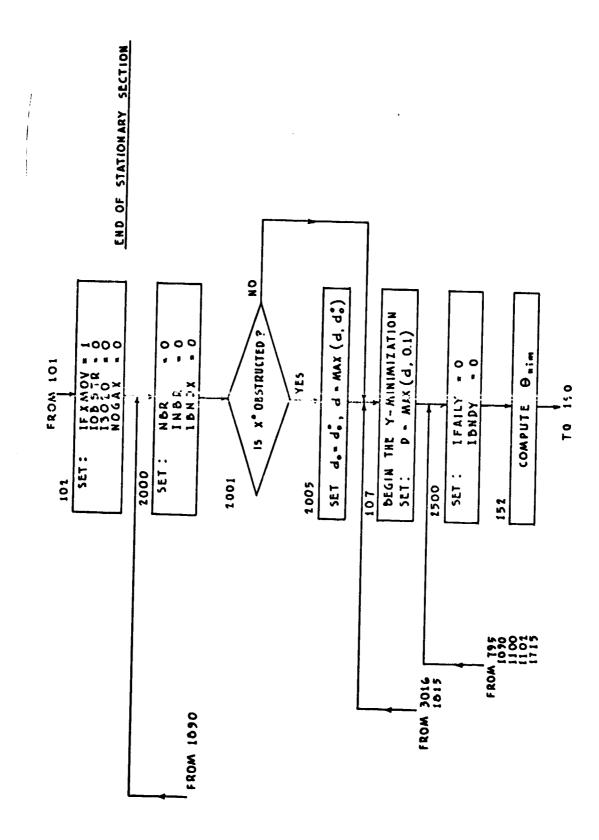
The fact that, for the class of games at issue, MaxMinF x y = MinMaxF can be exploited to arrive at the neighborhood of y x the optimal solution faster than the present program will: Start the problem as MinMaxF. The course of action then is reversed with considerable advantages. The maximizer sees the present y-allocation; the maximization is trivial, assigning as much weight as possible to the  $x_{hi}$  with the largest coefficients (the  $F_x(x,y^\circ)$ ), which results in a corner solution for x. Then the B-R technique is employed directly to F(x,y) which will bring x off the boundaries

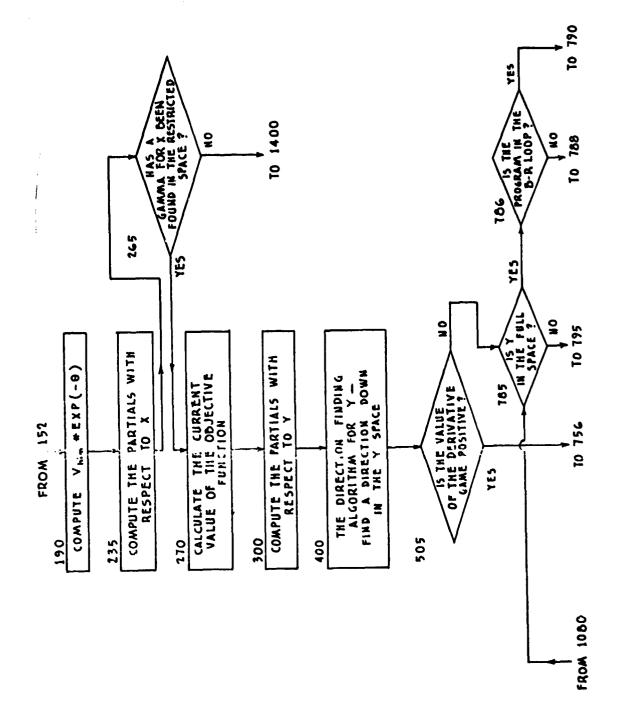
again, and, after a pre-set number of iterations, will produce an allocation not far from the solution. At this stage the problem is reinterpreted as MaxMinF and solved in the manner of the present program.

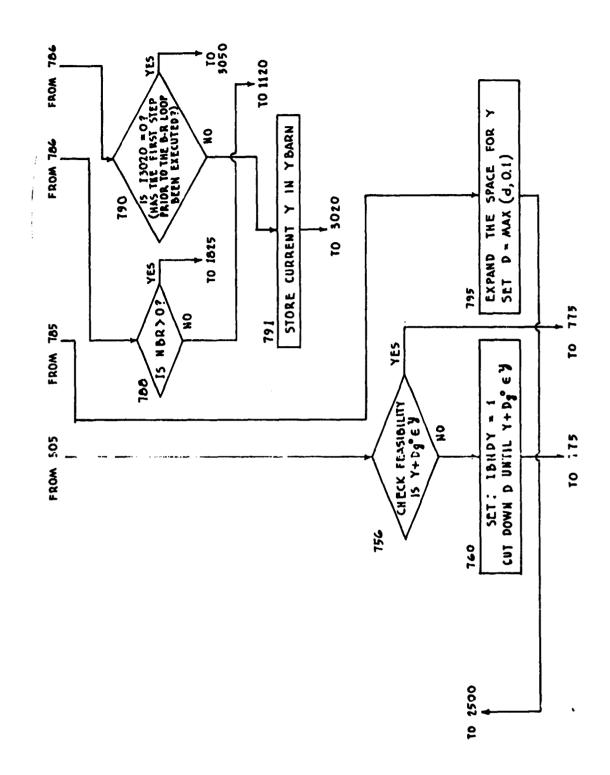
Another feasible refinement particularly useful in the application of the algorithm to objective functions linear in both x and y, i.e.,  $F = \sum_{ij} x_i a_{ij} y_j$ , is the idea of "doubling", outlined in [4]. The problem is treated as MaxMin and MinMax at the same time. Here the value of the game is approached from below and above simultaneously which provides a stopping rule when the difference  $\max_{x} F(x,y) - \phi(x)$  arrives at a pre-specified value.

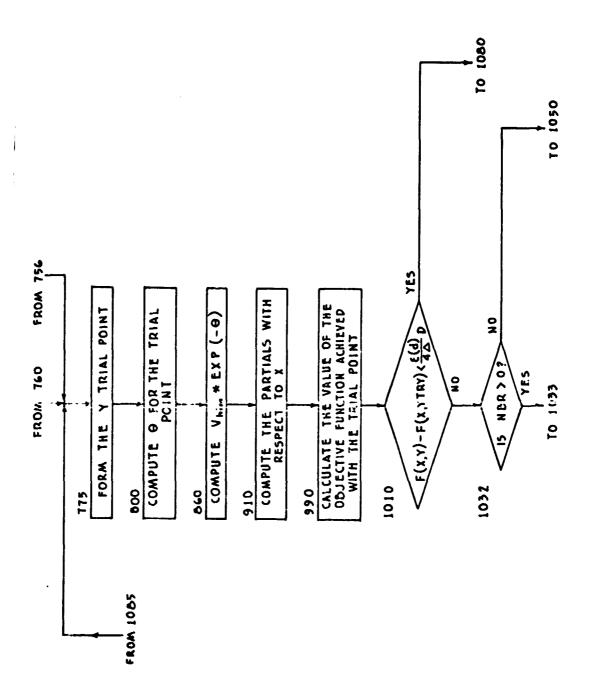
# APPENDIX: FLOWCHART OF THE PROGRAMMED EXAMPLE

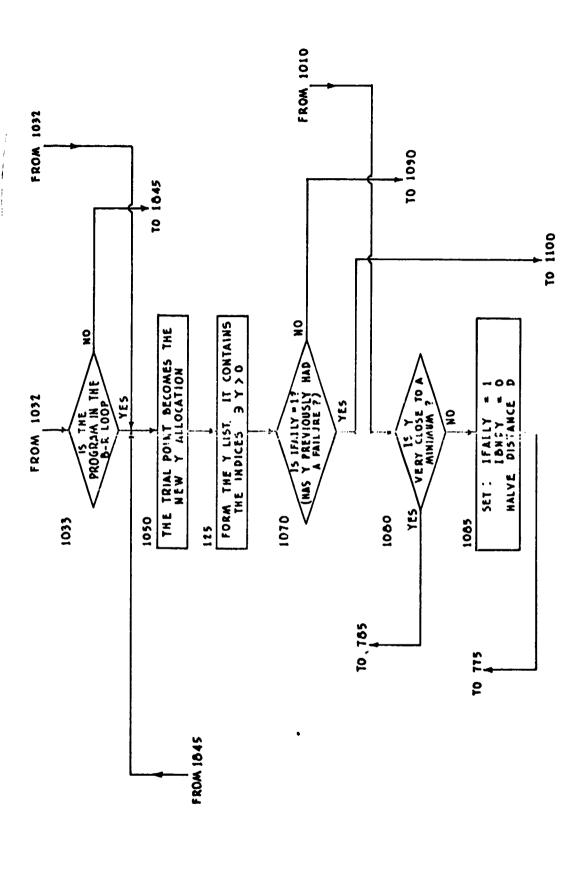


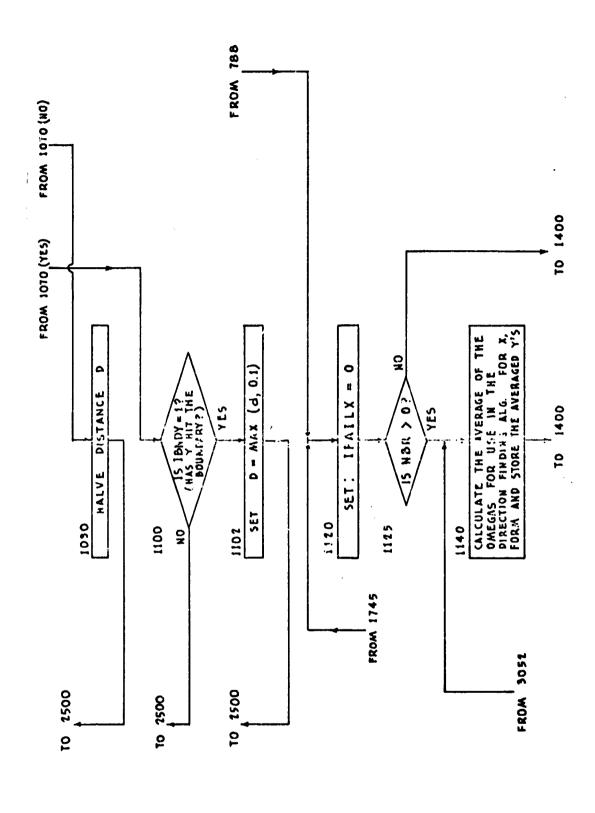


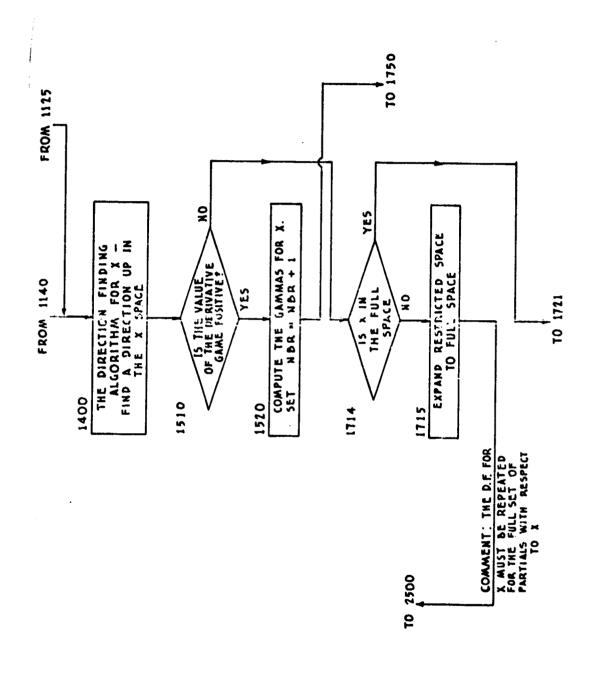


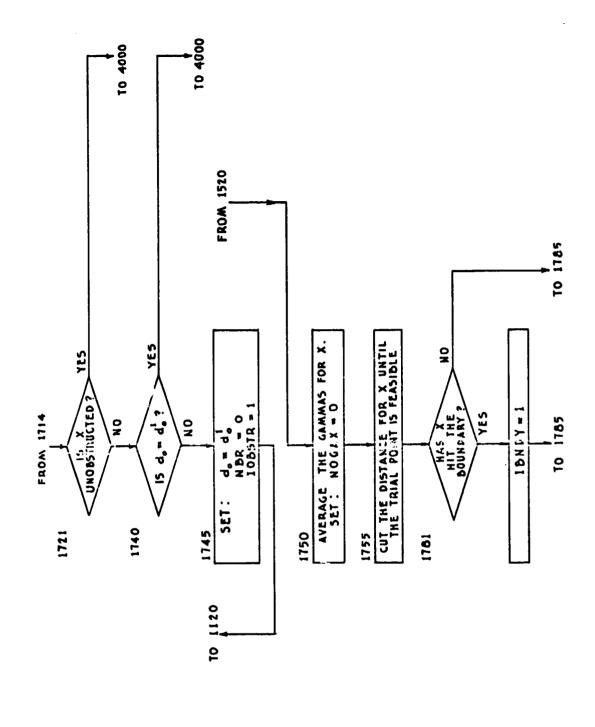


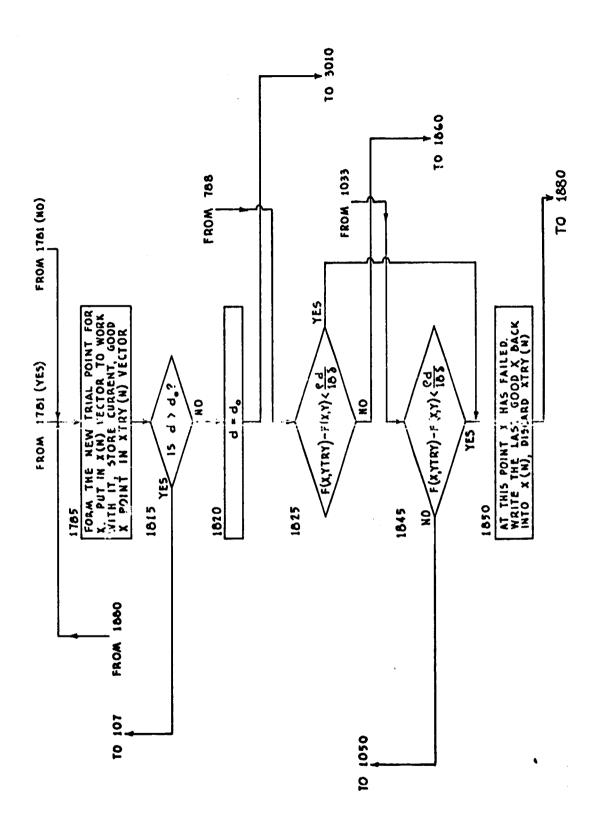


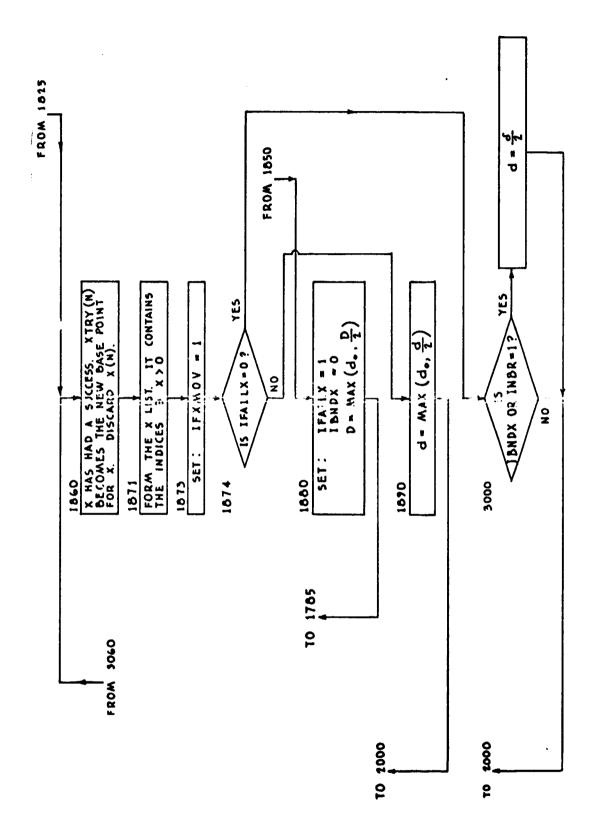


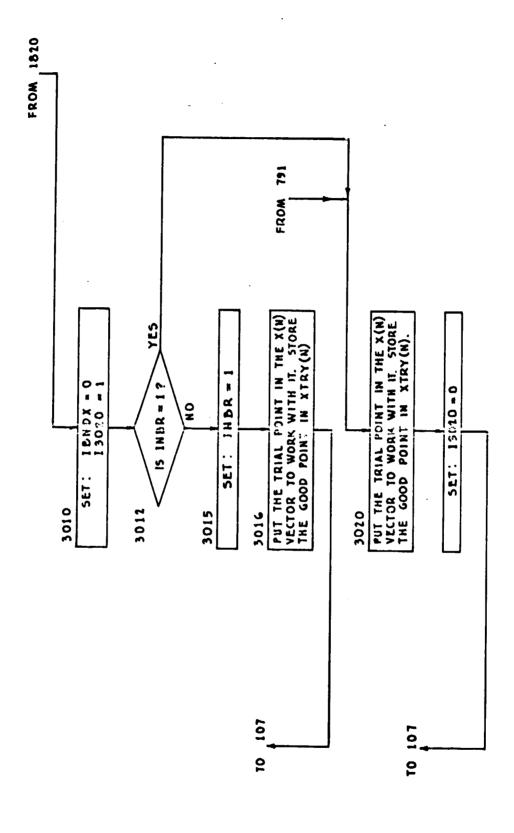


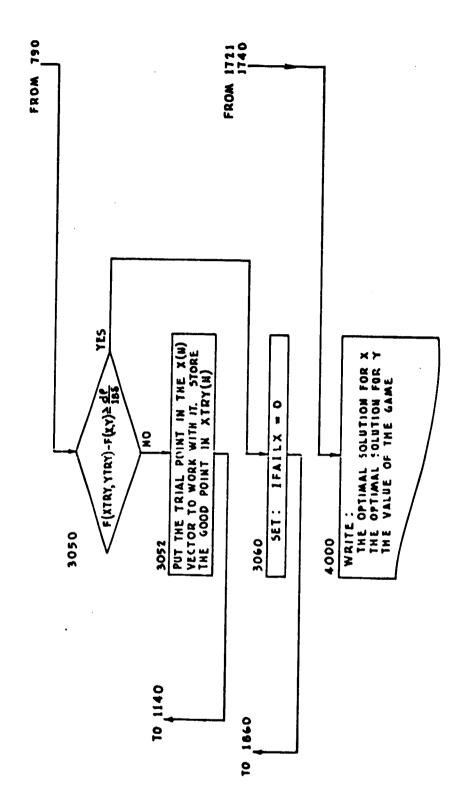












## COMPUTER PROGRAM LISTING

SPECIFIED FOR THE COMPUTATION GAME. ELEMENTS, MAXY READ(5,46)RFO FORMAT(8F10.6) READ(5,47)MAXH,MAXI,MAXJ,MAXK,MAXM,NMAX,MAXLK FORMAT(1615) IMPLICIT REAL\*8(A-H,0-Z)

DIMENSION X(16), XX(4), INDX(16), GAX(16),

16), IDSX(4), DDFX(4), XTRY(16), GAX(16),

2Y(50), YBARN(50), GAY(50), DFY(50), IDSY(16),

3C), C(8C), V(8O), NH(1CO), I(1CO), J(1CO), XA(10C), E(1CO), NH(1CO), I(1CO), J(1CO), XA(10C), E(1CO), NH(1CO), VE(8C), THETA(8C), YA(1CO), VE(8C), THETA(8C), YA(1CO), YA(1CO) OF X MAXX IS THE MAXIMUM NUMBER THE SAME FOR Y. THIS PROGRAM IS DESIGNED TO (APPROXIMATELY) OPTIMAL SONDIMENSIGNAL ALLOCATION PROFUNCTION IS \*\* F (x, Y) = SUM OVER M OF V(H, I, M) \*EXP(-TH THETA(H, I, M) \* SUM OVER J, K, M) \* C(H, J, L(K)) \* C(H, J, L(K) THE ACCURACY INITIALIZE TH THE CCNTRACTI GAMMA VECTORS DO 51 N=1, MAXX INDX(N)=N GAX(N)=0. NNX=MAXX OC 52 N=1, MAXY MAXX=MAXH#MAXI MAXY=MAXJ#MAXK RHO IS 1 51 0000000000 00000000COCOC

COMPUTE VMAX, THE MAXIMUM OSCILLATION OF THE VALUE OF DEL DOT THE PARTIAL WITH RESPECT TO X. MATRICES ZERO. AND THE MAXIMUM DISTANCES THAT ANY GNE ITERATION. IN THE BE RE-SET TO MAX(DFCRX,0.1) DELTAX AND DELTAY ARE THE STAMETERS OF THE X Y SPACES. DOXO AND DOXI ARE THE PARAMETERS OF ACCURACY FUR THE UNOBSTRUCTED AND DESTRUCTED X • COMPUTE THE VALUES OF THE VARIOUS DISTANCES. FOR X AND Y THE X AND Y ELEMENTS TG DCXC=RHO/(36.\*VMAX)
DCX1=D0X0/(2.\*MAXI\*CSQRT(DMAXH)
DELTAX=DSQRT(2.\*DMAXH)
DELTAY=DSQRT(2.\*DMAXH)
DFLTAY=DSQRT(2.\*DMAXH)
DFCRX=C.5\*DELTAX
DFORY=DFORX
CCX=D0XO GENERATE INITIAL ALLOCATIONS FIRST ELEMENT IN EACH ROW JF IS SET TO ONE, AND ALL OTHER 3 VMAX=0. DC 53 N=1. PAXX SUM=0. NN=MAXH\*(N-1) DO 57 L=1. MAXM NL=NN+L 7 SUM=SUM+V(NL) 1 F(SUM-GT-VMAX) MAXV=MAXX\*MAXM PX=MAXI\*MAXMAXM DMAXH=MAXH CMAXJ=MAXH CMAXJ=MAXH DFGRX AND DFGRY ARE X AND Y MAY MOVE AT PROCESS, DFGRY WILL DO 104 N=1, MAXH NX=MAXH\*(N-1)
DO 103 L=1, MAXI I NDY (N) = N GAY (N) = C. NNY = AAXY 25 53 58 9 57 65 COCO

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00000000

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01 NN=0

NFV=NH(N)

1V=1(N)

NY=1(N)

NY=1=NV-1

NY=MX=NHV-1

NY=MX=NHV-1

NY=MX=NHV-1

NY=MX=NHV-1

NY=MX=NHV-1

NY=MX=NHV-1

NY=MX=NHV-1

NY=NN=NN-1

NY=NN=NN-1

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NY=NN-1
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IBNDX=0
IF(IOBSTR.EC.0)GC TC 107
103
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AND
X IS OBSTRUCTED ACCORDINGLY.
  WHETHER
TO MOVE
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                       BEGIN THE Y MINIMIZATION.
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                         IF(DFORX,GT.0.1) GO TO 140

CFORY=0.1

GC TO 25C3

OFURY=DFORX

IFAILY=0

IBNDY=0
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                               GO TC 2024
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                               IFAILY CCNTROLS THE HIT IS O IF PREVIOUSLY PREVIOUSLY HAD A SUCCIHIT THE BOUNDARY AND
THE FCLLCWING TESTS PICKS THE DISTANCE
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                                                                                               DO XOC=1.-DO XO

NX=INDX(N)

XNX=X(NX)

IF(XNX-EQ-0) GO TO ZO

CCNTINUE

DC X=DO XO

DZ=DFU XX+O SO

DFDRX+DO XO

DFDRX-EDO XO

DFDRX-EDO XO

CCT TO X = DO XO

DFDRX-EDO XO

DFDRX-EDO XO

DFDRX-EDO XO

CCT TO X = DO XO

                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                  152 DC 155 (=1, MAXV

155 THETA(L)=0.

NT=NH(1)

NT=NH(1)

NN=NH(1)

NN=NH(N)

I I = I (N)

NX=MAXI*(NN-1)+II

NX=MAXI*(NN-1)+II

NA=NAXI*(NN-1)+II
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                            0-1x) GO
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                 2024
2024
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                        2500
                                                                                                           2005
2010
                                                                                                                                                                                                                                                                                   2012
2014
2014
2016
2020
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```
VE(NV)=VE(NV) +DEXP(-THETA(NV))
                                                                                                                                                                                                                                                                 THE INITIAL VALUE FOR V*EXP(-THETA) IS V.
                      GC TO 180

KNN=KX*(NN-1)+MAXM*(II-1)+MT

FN=KNN-MT+MM

IF(Y(JK)*LE**00CC00C00C01) GO TO 172

THETA(MN)=THETA(MNN)+A(N)*Y(JK)

GC TO 173

THETA(MN)=THETA(MNN)

KT=MM
                                                                                                                GO TO 180
IF(MM.GT.MT) GO TO 170
IF(Y.JK).LE..CGOSCOCOOC1) 30 TO 180
MN.EAX.(NN-1)+MAXM*(II-1)+MM
THETA(MN)=THETA(MN)+A(N)*Y(JK)
                                                                                                                                                                                                                                                 COMPUTE V(H,I,M) #EXP(-THETA)
                                                                                                                                                                                                                                                                                                                                                                                           V*EXP(-THETA) IS COMPLETE.
                K-MAXK*(JJ-1)+KK
                                                                                                                                                                                                                                                                                  DG 200 N=1, MAXV VE(N)=V(N) CO 230 N=1, NNX NX=INDX(N) NX1=MAXM(N) CO 220 L=1, MAXM NX=1)
162
                                           1663
1663
1665
                                                                                     167
                                                                                                                                         169
                                                                                                                        168
                                                                                                                                                                  176
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220
230
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173
180
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200
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COMPUTE THE PARTIALS WITH RESPECT TO X. SIMPLY SUM
THE ROW OF THE V(H,I,M)*EXP(-THETA) MATRIX.
                                                                                                                                                                               NOGAX=1 MEANS NO GAMMA FOR X HAS BEEN FCUND IN RESTRICTED SPACE .
                                                                                                                                                                                                                                CALCULATE THE CURRENT VALUE OF THE OBJECTIVE FUNCTION.
                                                                                                                                                                                                                                                                                                                                                                                                                         COMPUTE THE PARTIALS WITH RESPECT TO Y.
                                                                                                                                                                                                                                                                        FXY=0.

16 X(N) • LE. • 00C0000C00C01) GJ TO 280

17 X(N) • LE. • 00C0000C00C01) GJ TO 280

18 XY=FXY+X(N) * DFX(N)

10 CCNT INUE

FXY=FXY

11 F(I 30 20 • E0.1) GD TO 285

11 F(I SXRQV• EC.0) GG TC 287

12 FXJY0=FXY

13 XRQV=C. 10 300

14 XYT=FXY
                                                                                                                                                                                                                                                                                                                                                                                                                                                 A MUST BE RETRIEVED FROM THE LIST.
                                                                                                                                                                                                                  IF(NOGAX.EQ.1)G0 T0 1400
                              DD 236 N=1, MAXX
DFX(N)=0.
DC 260 N=1, NNX
NX= INDX(N)
NX1= MAXM*(NX-1)
DFDX=0.
DG 240 L=1, MAXM
DFDX=UFDX+VE(NL)
CCNTINUE
DFX(NX)=DFDX
CGNTINUE
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                       DO 330 N=1,NNV
NN=NH(N)
I I = I (N)
I X=MAXI*(NN-1)+II
                                                                                                                                                                                                                                                                                                                                                                                                                                                                       00 301 N=1, MAXY DFY(N)=0.
                                                                                                                                                                                                                   265
                                                                                                                                                                                                                                                                                                                                                                                                                                                                        300
301
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                        305
                                 235
236
237
                                                                                                    239
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280
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9
                                                                                                                                                                                                                                     THIS CONTRACTS THE SPACE AND GIVES THE PROPER UPPER BCUND ON DC-LCOP INDICES: NY= THE NUMBER RELEVANT ELEMENTS PER ROW.
                                                                                                                                                                                                    THE LOGIC SWITCH LOGICD IS USED TO DETERMINE WHETHER YMU HAS CHANGED (1) CR NOT (0).
                                                                                                                                      - FIND
THE DIRECTION FINDING ALGORITHM FOR Y A DIRECTION DOWN IN THE Y SPACE.
                                                                                                                                                                                                                                                                                                                                        [1] LE..0000000000001) SO TO 420
                                                                             SUMBO

2 DO 325 LEMM, MAXM

NV = MX*(NN-1)+MAXM*(II-1)+L

SUM = SUM+VE(NV)

5 CCNT INUE

DFY(JK)=DFY(JK)+SUM*SA(N)

5 CCNT INUE
                                                                                                                                                                                                                                                                  NSTART=1
00 500 NJ=1,MAXJ
SUM=0.
NCCUNT=0
NY=0
                                                                                                                                                                                                                          LCGICD=1
                                                                                                                                                                                                                                                                                                                    402410
         314
                                                                                                                        330
                                                                                                                                                                                                                                                                           402
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                             316
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                                                                320
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TEST WHETHER SMALL IS SMALLER THAN YMU.
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                NOW AS MANY ELEMENTS AS POSSIBLE HAVE DISTINGUISHED ON THE UPPER BOUND. GOLOWER BOUND.
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                       470
999999) GC TC 470
0 TC 470
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                      IF(SMALL.GE.YMU) GG TO 490
LOGICD=1
YMU=(NCGUNT*YMU+SMALL)/(NCGUNT+1)
NCCUNT=NCGUNT+1
SMALL=YMU
IDSY(MARK)=1
GG TO 460
                                    09
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                      NCW GO TO THE UPPER BOUND.
F(YY(L) • GE • • 9999999999999)
                                                                                               | COUNT | COUN
                                                                                                                                                                                                                                                                            425
                                                                                                                                                                                                                                                                                                                                                                                                                    4430
430
50
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                         440
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462
463
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477
478
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FORM THE TOTAL SUM OVER THE ENTIRE DISTINGUISHED SET.
                                                                                                                                                                                                                                                                                                                                                                    IS THE VALUE OF THE DERIVATIVE GAME POSITIVE?
                                                                                                                                              THIS MEANS THAT NO MORE ELEMENTS CAN BE DISTINGUISHED.
                                                               YMU=(NCOUNT*YMU+SMALL)/(NCOUNT+1)
NCOUNT=NCOUNT+1
IDSY(MARK)=1
SMALL=YMU
GC TO 475
IF(LUGICO-EQ-0) GO TO 496
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                               IF(TOTAL-GT..CJOCCCJ1) GO TO 518
TGTAL=0.
DO 517 N=1,NNY
SD(N)=SD(N)*1005C0290.
TGTAL=TGTAL+SD(N)**2
                                                                                                                                                                                                                                                                                                                                                                                                                                        IF THIS TEST FAILS, PREMUSCUARING TO PREVENT THE MAGOUAL TO ZERO. STEP UP THE PROPERTIONATELY.
                                                                                                                                                                                5 LGGICD=0

6C TO 475

6C TO 450

6 DC 499 L=1,NY

NL=NSTART+L-1

ILIDSY(L) • EQ. 1) GO TO 498

7 SC(NL) = 0

6C TO 499

8 SO(NL) = DDFY(L) - YMU

9 CCNT INUE

NSTART=NSTART+NY
CCNTINUE
IF(SMALL•LE•YMU) GO TO 495
LCGICD=1
                                                                                                                                                                                                                                                                                                                                                                                            TCTAL=0.
DC 515 N=1.NNY
TOTAL=TOTAL+SD(N)**2
                                            RECALCULATE YMU.
                                                                                                                                                                                              495
480
                                                                                                                                                                                                                    456
                                                                                                                          490
                                                                                                                                                                                                                                                     164
                                                                                                                                                                                                                                                                          458
499
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PRO-
Y WOULD
NEW
ASSED
EPSLON=(RHO*DFORX*100000000.)/(36.*DELTAX*DELTAY)
EPSLON=EPSLON**2
IF(TOTAL.LE.EPSLON) GO TO 785
GC TO 520
EPSLCN=(RHO*DFORX)/(36.*DELTAX*DELTAY)
EPSLCN=EPSLCN**2
IF(TOTAL.LE.EPSLCN) GO TO 785
YLA=0SQRT(TOTAL)
OC 525 N=1,NNY
GAY(N)=SD(N)/YLA
                                                                                                                                                                                                                                                                                                                                                                         00 776 L=1,MAXY

YTRY(L)=0.

DC 780 N=1.NNY

JY=INDY(N)

YTRY(JY)=Y(JY)+DFORY*GAY(N)

IF(YTRY(JY)=0.

GO TO 780

IF(YTRY(JY)=0.

GO TO 780

IF(YTRY(JY)=1.
                                                                                                                                                                                                       DTEST=DFCRY
DD 770 N=1,NNY
IF(GAY(N),EQ.0.) GD TG 770
JY=INDY(N)
YTEST=Y(JY)+DFORY*GAY(N)
IF(YTEST-LT.0.) DFORY=-Y(JY)/GAY(N)
IF(YTEST-GT.0.) DFORY=(I.-Y(JY))/GAY(N)
CCNTINUE
                                                                                                                                                                                                                                                                                                            IBNDY
                                                                                                                                                                                                                                                                                                         IF Y HAS HIT A BOUNDARY, SET
                                                                                                                                                                                                                                                                                                                               IF(DTEST.GT.DFORY) IBNDY=1
                                                                                                                                                                                                                                                                                                                                                     FORM THE Y TRIAL PCINT.
                                                                                                                         AFTER CCMPUTING
POSED DIRECTION
LEAVE ITS SPACE
NECESSARY THEN
TRIAL VALUE FOR
AFTER FINITELY MA
                                                                                                   525
                                             518
                                                                              520
                                                                                                                                                                                                                                                                                   770
                                                                                                                                                                                                                                                                                                                                                                                                                                                                   119
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CBJECTIVE
SON WILL THEN
CCESSFULLY
HE CURRENT X
                                                                                                                                                                                                                                                                                               SET DFORY=MAX(CFORX,0.1).
                                                                                                                                                                                                            8-R LOOP
THIS BLOCK CONTROLS THE FOLLOWING:

IF THE Y-MIN HAS BEEN OBIA NED IN THE F
SPACE, THE MINIMUM IS CHECKED FOR VALIF
FULL SPACE; AFTER X HAS MOVED, Y MININ
COMPLETELY; WHEN IN B-R, Y MINIMIZES (
WHEN IN E-R X USES THE WHOLE SPACE.
                                                                                                                                                                                                                                                                                                                                                                                                                               NOW, USING THIS TEST VALUE FGR Y, THE FUNCTION CAN BE EVALUATED. A COMPARISH MADE TO DETERMINE WHETHER Y HAS SURDEMONSTRATED THE ABILITY TO COUNTER THE
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                 COMPUTE THETA FOR THE TRIAL PCINT
                                                                                                                                                                                                           STEP PRIOR TO THE
                                                                                                                                 8-R L00P?
                                                                                                                                                                                                                                                                                                EXPAND THE SPACE FOR Y. STORE CURRENT Y IN YBARN.
                                                                                                                                                                                                                                                                                                                             5 DC 796 N=1, MAXY
6 INDY(N)=N
NNY=MAXY
IF(DFORX•GT•0-1) GO TO 798
DFORY=0-1
GC TO 2550
B DFORY=DFCRX
GC TC 2550
                                                                                      IS Y IN THE FULL SPACE?
                                                                                                                                                                                                                                          IF(13220,EQ,C) GO TO 3050
DC 791 N=1,MAXY
YEARN(N)=Y(N)
GC TO 3020
                                                                                                                                IS THE PROGRAM IN THE
                                                                                                          IF(NNY-LT.MAXY)GO TO 795
                                                                                                                                                    IF(INBR, EQ.C)GO TO 738
GC TO 795
IF(NBR, EQ.0)GO TO 1120
GC TO 1825
                                                                                                                                                                                                           HAS THE FIRST
EXECUTED?
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                      801 N=1, MAXV
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                       2
                                                                                                           785
                                                                                                                                                      786
787
788
789
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FNN=MX*(NN-1)+MAXM*(II-1)+MT

MN=MNN-MT+MM

IF(YTRY (JK)*EQ*O*) GG TO 824

THETA(MN)=THETA(MNN)+A(N)*YTKY(JK)

GG TO 826

THETA(MN)=THETA(MNN)

PT=MM

CCNTINUE
                                                                                                                                                                                                                                                                                        COMPUTE V(H, I,M)*EXP(-THETA).
                                      Western; 60 TO 810
1.6Telt; 60 TO 810
3 815
                                                                                                            AXK*(JJ-1)+KK
(N)
11 THETA(N)=0.

NT=NH(1)

NT=N(1)

MT=M(1)

NG 850 N=1, NNV

NN=NH(N)

II = I(N)
                                                                                                                                                                                                                                                                                                      840
870
812
                                                                                                                                                                                              815
816
817
                                                                                                                                                                                                                              820
                                                                                                                                                                                                                                                  822
                                                                                                                                                                                                                                                               8824
8264
5364
              801
                                       802
                                                                  803
                                                                                     805
                                                                                                  807
                                                                                                                                                                  812
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```
TEST THE NEWLY CALCULATED VALUE OF THE CBJECTIVE FUNCTION.
             NV=NX1+L

IF(V(NV).eq.0.)GO TG 895

IF(THETA(NV).GT.0.) VE(NV)=VE(NV)*DEXP(-THETA(NV))

CONTINUE

CONTINUE
                                                                                                                 COMPUTE THE PARTIALS WITH RESPECT TO X. SIMPLY SUM THE ROW OF THE V*EXP(-THETA)-MATRIX
                                                                                                                                                                                                                                                                                                                                CALCULATE THE VALUE OF THE OBJECTIVE FUNCTION ACHIEVED WITH THE TRIAL POINT.
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                THE TRIAL POINT BECOMES THE NEW Y ALLOCATION.
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                      FDIFF=FXYSAV-FXYT
EPSLON=(RHG*DFORX*DFORY)/(144,*DELTAX*DELTAY)
IF(FDIFF.LT.EPSLCN) GO TO 1080
IF(NBR.EQ.O) GO TO 1050
IF(INBR.EQ.1)GO TO 1050
GO TO 1845
                                                                                                                                                                                                                                                                                                                                                                     FXY=0.
DQ 1000 N=1.MAXX
IF(X(N).LE.CO00000000001) GC TO 1000
FXY=FXY+X(N)*DFX(N)
CCNTINUE
FXYT=FXY
                                                                                        V*EXP(-THETA) IS COMPLETE.
                                                                                                                                                       DD 920 N=1, PAXX
DD 980 N=1, NNX
NX=INDX(N)
NX1=MAXM*(NX-1)
DF 0X=0 L=1, MAXM
NL=NX1+L
DF 0X=0 F 0X+VE(NL)
CONTINUE
CFX(NX)=DF 0X
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                           DO 1060 N=1, MAXY
L=1, MAXM
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                           10 50
                                                                                                                                                                                                                                                                                                                                                                                                            1000
                                                                                                                                                                                                                                       940
                                                                                                                                                                                                                                                                            950
                                                                                                                                                                                                                                                                                                      980
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                        1610
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ENSURE
BE
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                        FORM THE Y LIST. IT CONTAINS THE INDICES SUCH THAT Y>0.
                                                                                                  THE FOLLCWING TESTING BLOCK IS NECESSARY TO THAT THE TESTS FOR Y ON THE BOUNDARIES WILL PROPERLY HANDLED BY THE MACHINE.
                                                                                                                                                                                                                                            IF(Y(N).GT..CODOCOCODOD1) GO TO 1053
Y(N)=0.
GO TO 1C60
IF(Y(N).LT..99999999999) GU TO 1060
Y(N)=1.
CONTINUE
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                         IS Y VERY CLOSE TO THE MINIMUM?
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                         6 PSLON=(RHO*DFORX)/(36.*DELTAX)
YLAD=YLA*DFORY
IF(YLAD•LE•EPSLON) GO TO 785
IBNDY*=0
FORY*=0

                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                IF(IFAILY, EC.O)GO TO 1100
GC TC 1C90
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                    NY=0
DO 150 N=1,MAXY
IF(Y(N).GT.C.) GO TO 145
GO TO 150
Y(N)=YTRY(N)
YBARN(N)=Y(N)
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                         GO TO 150
NY=NY+1
INDY(NY)=N
CCNTINUE
NNY=NY
                                                                                                                                                                                                                                                                                                                                                                                         00000
21
20000
                                                                                                                                                                                                                                                                                                                                                        1053
                                                                                                                                                                                                                                                                                 1051
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1103
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GR NOT THE
IS. THE
PRIOR TO
THE MAXIMIZATION OF X BEGINS. SINCE THE CURRENT VALUES OF THE PARTIALS WITH RESPECT TO X HAVE BEEN OBTAINED PRIOR TO THIS BUT IN RELATION TO THE CORRECT ALLOCATIONS, THESE PARTIALS SERVE AS THE INPUT TO THE DIRECTION FINDING ALGORITHM FOR X.
                                                                                                                                                                                                                                                                                           FOR USE IN THE FORM AND STORE
                                                                                                                                                                                                                                                                                                                                                                                                                                                                           4
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                    THIS CONTRACTS THE SPACE AND GIVES THE PROPER UPPER BGUND ON DG-LOOP INDICES: NX=NUMBER OF RELEVANT ELEMENTS PER ROW.
                                                                                                                                                                                                                                                                                                                                                                                                                                                                         FIND
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                     THE LGGIC SWITCH LOGICD IS USED TO DETERMINE WHETHER XMU HAS CHANGED (1) CR NOT (0).
                                                                                                                                                             IT IS NECESSARY NOW TO DETERMINE WHETHER BROWN-RCBINSON ROUTINE IS IN USE. IF IT AVERAGE OF THE OMEGAS MUST BE CALCULATED ENTERING THE DF ALGORITHM FOR X. FORM AND STORE THE AVERAGED Y.S.
                                                                                                                                                                                                                                                                                                                                                                                                                                                                           ×
                                                                                                                                                                                                                                                                                          CALCULATE THE AVERAGE OF THE CMEGAS DIRECTION FINDING ALGORITHM FOR X. THE AVERAGED Y'S.
                                                                                                                                                                                                                                                                                                                                                                                                                                                                           FOR
                                                                                                                                                                                                                                                                                                                                                         DQ 1145 N=1,MAXY
YBARN(N)=(NBR*YBARN(N)+Y(N))/(NBR+1)
CCNT INUE
DC 1147 N=1,MAXX
DMBAR(N)=((NBR-1)*OMBAR(N)+DFX(N))/NBI
DFX(N)=CMBAR(N)
                                                                                                                                                                                                                                                                                                                                                                                                                                                                         ALGONITHM
SPACE.
                                                                                                                                                                                                                                                                                                                                                                                                                                                                        THE DIRECTION FINDING DIRECTION UP IN THE X
                                                                                                                                                                                                                                                            IF(NBR. EC. 0) GO TO 1400
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                  NSTART=1
DOXC=1.--DOX
DC 1500 KJ=1,MAXH
SUM=0
NCCUNT=0
NX=0
                                                                                               IFAILX=0
DO 1123 N=1,MAXX
CPBAR(N)=DFX(N)
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                     1=021997
                                                                                               1120
                                                                                                                                                                                                                                                            1125
                                                                                                                                                                                                                                                                                                                                                          1140
                                                                                                                                                                                                                                                                                                                                                                                          1145
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                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                       1401
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                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                           00000
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```
IN CHECKING THE BGUNDARIES, ALLOWANCE IS MADE FOR THE PCSSIBILITY OF X BEING OBSTRUCTED.
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                 TEST WHETHER SMALL IS SMALLER THAN XMU.
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                             XMU=(NCDUNT*XMU+SMALL)/(NCDUNT+1)
NCCUNT=NCOUNT+1
                                                                                                                                                                                                 1412 IF(XX(L) LT DOX) GD TD 1420
15 IF(XX(L) GT DOXC) GD TD 1420
10 SX(L) = 1
10 SX(L) = 1
1420 SUM + DDFX(L)
1425 SMU = SUM / NCOUNT
1430 SWALL = XMU
SMALL = XMU
SMALL = DDFX(1)
1435 DO 1440 L=1:NX
IF(CMEGA=DDFX(L)
IF(CMEGA=DDFX(L)
IF(CMEGA=DDFX(L)
IF(CMEGA=DFX(L)
IF(CMEGA=DDFX(L)
                                                                                                                                                                                                                                                                                                                                                                                                                                                                            NGW GO TC THE UPPER BOUND.
1402 DG 1405 N=NSTART,NNX
IX=INDX(N)
IF(IX•6T•NTEST) GG TG 1410
1403 NX=NX+1
DDFX(NX)=DFX(IX)
XX(NX)=DFX(IX)
1405 CCNTINUE
1410 DG 1420 L=1,NX
IOSX(L)=0
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                            IF(SMALL.GE.XMU)GO TO 1490
LOGICD=1
XMU=(NCOUNT*XMU+SMA!!)/INC
                                                                                                                                                                                                                                                                                                                                                                                                                                                 X NU=SMAL
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                1470 ° °
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                           1450
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                       1461
1462
1463
                                                                                                                                                                                                                                                                                                                                                                                                                                                                COO
```

```
SD BEFORE
FROM SETTING THEM
F VALUE
                                                                                                                                                                                                                                                                                                                                                                                           THE DIRECTION FINDING ALGORITHM FOR X MUST BE REPEATED WITH THE FULL SET OF PARTIALS WITH RESPECT TO X.
                                                                                                                                                                                                                                                                                                                                      EXPAND THE RESTRICTED X SPACE TO FULL SPACE.
IS
                                                                                                        TEST THE VALUE OF THE DERIVATIVE GAME. POSITIVE?
                                                             SQUARING TO PREVENT THE MACHINE EQUAL TO ZERO. STEP UP THE TEST PROPORTIONATELY.
                                                                                                                                                                                                                                            0 XLA=DSQRT(TCTAL)
00 1522 N=1,MAXX
6 AX(N)=0.
00 1525 N=1,NNX
IX=INDX(N)
5 GAX(IX)=SD(N)/XLA
5 NBR=NBR+1
6C TO 1750
4 IF(NNX,EC,MAXX) GD TO 1720
                                                                                                                                                                                                                            COMPUTE THE GAMMAS FOR
                          TGTA!=0.
DG 1515 N=1,NNX
TGTAL=TGTAL+SD(N)**2
                                                                                                                                                                                                                                                                                                                                                       DO 1716 N=1,MAXX
INDX(N)=N
NNX=MAXX
                                                                                                                                                                                                                                                                                           1525
1705
                                                                                                                                                                                                                                                                                                                     1714
                                                                                                                                                                                                                                                                                                                                                         1715
                                    1510
                                                                                                                                              1517
                                                                                                                                                                                          1518
                                                                                                                                                                                                                                               1520
                                                                                                                                                                                                                                                                1522
                                                      ับบบบบบ
                                                                                                                                                                                                                                                                                                                                                                                    ರದಿಯಿಂ
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```
CUT THE DISTANCE UNTIL THE TRIAL POINT X IS FEASIBLE.
                                                                                                                                                                                                                          DO 1752 N=1,MAXX
GBARX(N)=((NBR-1)*GBARX(N)+GAX(N))/NBR
NCGAX=0
                                                                                                                                                                      AVERAGE THE GAMMAS FOR X.
                                                                                                                             IF(DDX.EQ.DCX!) GG TG 4000
DCX=DGX!
NBR=0
ICBSTR=1
GC TG II20
                                                                                                                                                                                                                                                                                    1781 IF(DTEST.GT.DFORX) IBNDX=1
                                 IS X UNOBSTRUCTED?
GC TO 2500
DOXC=1.-DOX
OO 1730 N=1,MAXX
XN=X(N)
     172C
                                             745
                                                                                                                                                                                  1750
                                                                                                                                                                                                                                                                         1780
```

```
THE NEW TRIAL POINT FOR X. PUT IN X(N) VECTOR ISK WITH IT. STORE CURPENT, GOOD X POINT IN N VECTOR.
                                                                                                                                                                                                                            THIS TEST DIRECTS THE PROGRAM INTO THE B-R ROUTINE BY ITS FAILURE.
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                            BASE
                                                                                                                                                                                                                                                                                                                                                                                                                                                                   AT THIS POINT X HAS FAILED, WRITE THE LAST GOOD X BACK INTO X(N), DISCARD XTRY(N).
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                        X HAS HAD A SUCCESS. XTRY(N) BECOMES THE NEW POINT FOR X. DISCARD X(N).
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                DO 1876 N=1,NNX
NX=INDX(N)
IF(X(NX),GE.0000000000001)GU TO 1863
X(NX)=0.
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                            TO 1870
                                                           5 DO 1786 N=1, MAXX
5 XTRY(N)=0.
7 DC 1790 N=1, NNX
1X=1NDX(N)
0 XTRY(IX)=X(IX)+DFORX*GBARX(IX)
0 DO 1810 N=1, MAXX
XTRY(N)=X(N)
XTRY(N)=XHOLD
0 CCNTINUE
                                                                                                                                                                                                                                                                   IF(DFORX,GT.DCX)GO TO 107
DFORX=DOX
GC TO 3010
FDIFF=FXYT-FXOYO
EPSLCN=(RHO*CFORX)/(18.*DELTAX)
IF(FDIFF-LT.EPSLCN) GO TO 1856
GO TO 1860
                                                                                                                                                                                                                                                                                                                                                                                          FDIFF=FXYT-FXGYC

EPSLGN=(RHC*DFGRX)/(18.*DELTAX)

IF(FDIFF.LT.EPSLGN) GG TG 1850

GG TG 1050
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                     GG TC 1870
IF(X(NX).LE..9999999999999)GG
X(NX)=1.
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                              DO 1852 N=1, MAXX
X(N)=XTRY(N)
GO TO 1880
                                                                                                                                                                                                                                                                                                                   1825
                                                                                                                                                                                                                                                                                                                                                1830
1831
C 1845
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                               1850
                                                             1785
1786
1787
                                                                                                                                                                                                                                                                                                                                                                                                                                      1847
                                                                                                                       1790
1800
                                                                                                                                                                                               1810
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                    1860
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                              1863
```

```
PUT THE TRIAL POINT IN THE X(N) VECTOR TO WORK WITH IT. STORE THE GOOD POINT IN XTRY(N).
                                              WHEN NOT IN B-R ROUTINE REFORM THE X-LIST. IT CONTAINS THE INDICES SUCH THAT X>0 .
                                                                                              872 N=1, MA XX
(N) . LE.. COOCCOCOCOCOOO) GD 1872
                                                                                                                                                                                                 T=0FCRX*0.5
TEST.6T.DOX) GO TO 1885
X=0CX
O 1785
X=01EST
                                                                                                                                                                                                                                                             ÖŘX*0.5
(GT.DOX) GO TO 1895
                                                                                                                                                        AILX.EC.0)GO TO 3000
1890
X=1
                                                                         IF(INBR.EQ.1) GO TO 1873
NX=0
                                                                                                                                                                                                                                                                                                                                                            |3026=1
|F(|NBR.EQ.1)GO TO 3020
|NBR=1
1870 CCNTINUE
C
C
                                                                                                                                                                                                                                                                                                                                                                     3012<sup>-</sup>
3015
                                                                                                                                                      1873
1874
1875
1880
                                                                                                                                                                                                                                                             1890
                                                                                                                                                                                                                                                                                                   1895
                                                                                                                                                                                                                        1882
                                                                                                                                                                                                                                           1885
                                                                                                                                                                                                                                                                                                                      3000
                                                                                                                                                                                                                                                                                                                                                  3010
                                                                                                                                                                                                                                                                                                                                                                                                                                                        3017
                                                                                                                                   1872
                                                                                                                                                                                                                                                                                1892
                                                                                                                                                                                                                                                                                                                                                                                                                              3016
                                                                                     1871
```

```
WRITE THE (APPROXIMATELY) OPTIMAL STRATEGIES FOR AND FOR Y AND THE VALUE OF THE GAME.
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                IN CASE THE PROGRAM ARRIVES AT A SOLUTION WHILE IN THE B-R ROUTINE, THE AVERAGED Y'S REPRESENT OPTIMAL STRATEGY FOR Y.
PUT THE TRIAL POINT IN THE X(N) VECTOR TO WORK WITH IT. STORE THE GOOD PICINT IN XTRY(N).
                                                                                                                                                                                                                                                                           PUT THE TRIAL POINT IN THE X(N) VECTOR TO WORK WITH II. STORE THE GOOD POINT IN XTRY(N).
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                           WRITE(6,4001)
WRITE(6,4002)(X(N),N=1,4)
WRITE(6,4002)(X(N),N=1,4)
WRITE(6,4002)(X(N),N=5,8)
WRITE(6,4002)(X(N),N=9,12)
WRITE(6,4002)(X(N),N=13,16)
WRITE(6,4002)(X(N),N=13,16)
FORMAT('C',30X,4F16.10)
WRITE(6,4003)
                                                     10 DD 3021 N=1,MAXX

XHOLD=X(N)

X(N)=XTRY(N)

XTRY(N)=XHOLD

11 CCNTINUE

12 J2C=0

6C TO 107

6C TO 107

6C FDIFF=FXTYT-FXOYO

EPSLUN=(DOX*RHO)/(18**DELTAX)

IF(FDIFF*GE*EPSLON) GO TO 3060
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                             IF(INBR.EQ.0)GO TO 4008
DC 4007 N=1, MAXY
Y(N)=YBARN(N)
WRITE(6,4004)(Y(N),N=1,10)
WRITE(6,4004)(Y(N),N=11,20)
                                                                                                                                                                                                                                                                                                                                   2 DO 3053 N=1,MAXX
XHOLD=X(N)
X(N)=XTRY(N)
XTRY(N)=XHOLD
CCNTINUE
GO TO 1140
O IFAILX=0
GC TO 1860
                                                                                                                                    3021
                                                                                                                                                                                              3050
                                                                                                                                                                                                                                                                                                                                                                                                                                                          3060
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                           4003
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                    4002
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